





# Numerical Air Quality Prediction (NAQP) for the Northeast US during ICARTT-2K4: MAQSIP-RT Results in Context

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#### **Acknowledgements**

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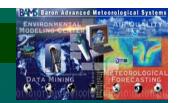
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#### **Outline**

- Introduction and Background
- Description of ICARTT-2K4 and its Modeling Study
- MAQSIP-RT Results in Context of Seven Member Ensemble
- Study Conclusions: Individual Models and Ensembles
- Baron Advanced, Where are we going?



#### **Introduction and Background 1**

**Numerical Air Quality Prediction (NAQP)** 

- NWP model(s)
- Anthropogenic and Biogenic Emissions Model(s)
- Photochemical/Particulate Atmospheric Chemistry Model(s)
- Data Ingest
- Model Output
- Product Dissemination within operational forecasting deadlines



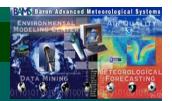


#### **Introduction and Background 2**

#### Numerical Air Quality Prediction (NAQP) Example Modeling Systems

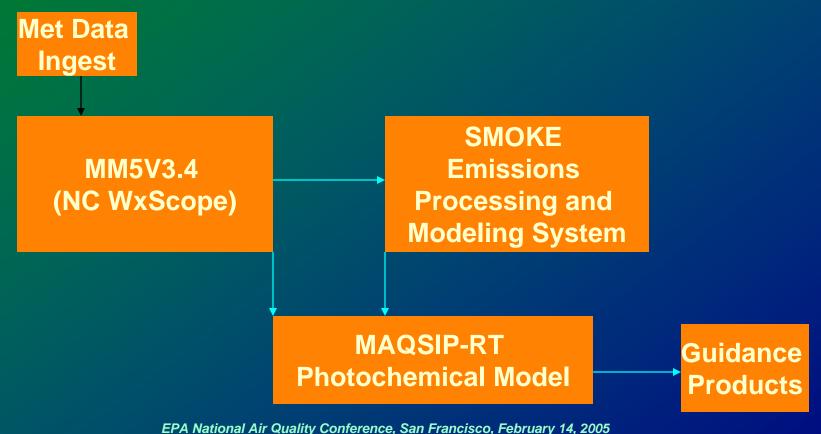
NAQP Modeling System	Operational (Since)	Research
MAQSIP-RT	x (2000)	
ETA-CMAQ	x (2004)	
WRF-Chem		x (2002)
CHRONOS	x (1999)	





#### **Introduction and Background 3**

#### **BAMS Component Models** and DataFlows

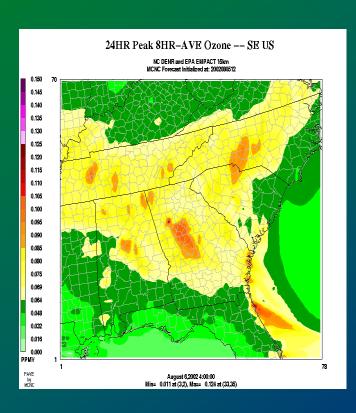


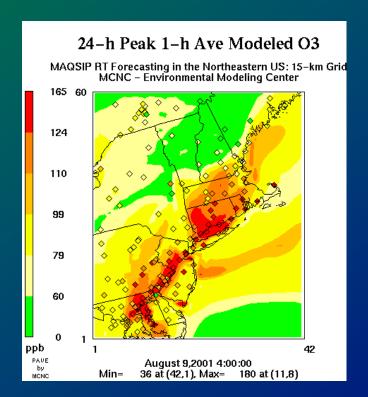




#### **Introduction and Background 4**

#### **Typical Output Guidance Products**









#### **ICARTT**

International Consortium for Atmospheric Research on Transport and Transformation

The three focus areas for this research are regional air quality, intercontinental transport, and radiation balance.

#### • 13 Aircraft

#### • 5 Countries

#### **Funding by**

National Oceanic and Atmospheric Administration (NOAA)

National Aeronautics and Space Administration (NASA)

U.S. Department of Energy (DOE)

National Science Foundation (NSF)

U.S. Environmental Protection Agency (EPA)

Office of Naval Research

Integrated Program Office

Environment Canada

National Research Council of Canada

National Environment Research Council (NERC, NCAS, UTLS)

Institut National des Sciences de l'Univers et de l'Environnement

Agence de l'Environnement et de la Mattrise de l'énergie

Institut Pierre Simon Laplace des sciences de l'environnement

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Max-Planck-Gesellschaft (MPG)

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#### **Partners**

NASA Armes Research Center NASA Dryden Flight Research Center NASA Goddard Space Flight Center NASA Langley Research Center NOAA Aeronomy Laboratory NOAA Aircraft Operations Center NOAA Atlantic Oceanographic and Meteorological Laboratory

NOAA Climatic Monitoring and Diagnostic Laboratory

NOAA Environmental Technology Laboratory NOAA Forecast Systems Laboratory NOAA Geophysical Fluid Dynamics Laboratory NOAA National Geophysical Data Center NOAA Pacific Marine Environmental Laboratory DOE Argonne National Laboratory DOE Brookhaven National Laboratory

DOE Pacific Northwest National Laboratory DLR-Aircraft Operation Department DLR-Institute for Atmospheric Physics

Aerodyne Research Inc. Assoc, for the Study of the Insular Environment

Atmospheric Observing Systems Baron Advanced Meteorological Systems California Institute of Technology

Castle Springs

Center for Interdisciplinary Remotely-Piloted Aircraft Studies

Cisco Systems

Cooperative Institute for Research in Environmental Sciences Dalhousie University

Desert Research Institute Exeter Hospital Facility for Airborne Atmospheric Measurements Georgia Institute of Technology Harvard University/ Harvard Forest Isles of Shoals Steamship Company Joint Institute for the Study of the Atmosphere & Ocean

Lakes Region Conservation Trust Liberty Mutual Group

Maine Dept. of Environmental Protection Maryland Department of the Environment Max-Planck Institute for Chemistry

Max-Planck Institute for Chemistry Max-Planck Institute for Nuclear Physics MCNC Environmental Program

Meteorological Service of Canada Michigan Technological University

Mount Washington Observatory National Center for Atmospheric Research

NH Community Technical College NH Department of Environmental Services New Mexico Institute of Mining & Technology

Northeast States Center for a Clean Air Future Northeast States for Coordinated Air Use Mgmt.

Orient Fire Department Pease Development Authority

Pennsylvania State University Physical Sciences Inc.

Phymouth State University Portsmouth Regional Hospital Portuguese Institute of Meteorology

Research Centre Karlsruhe Scripps Institution of Oceanography

Seacoast Science Center Service d'Aéronomie/CNRS, IPSL

Shoals Marine Laboratory State University of New York-Albany The Florida State University

University of Bremen

University of California, Berkeley University of California, Davis

University of California, Los Angeles

University of California, San Diego

University of Cambridge

University of Colorado University of Denver

University of Denver University of East Anglia

University of Hawaii

University of Heidelberg University of I owa.

University of Leeds

University of Leicester University of Manchester Institute of

Science and Technology University of Maryland

University of Massachusetts-Amherst

University of Miami

University of New Hampshire (UNH) UNH Institute for the Study of Earth,

Oceans, and Space (EOS) UNH Whittemore School of Business

and Economics (WSBE)

University of Reading University of Rhode Island

University of the Azores University of Utah

University of Virginia

University of Washington University of York

University of York

Wentworth-Douglass Hospital Western Michigan University

Woods Hole Oceanographic Institution





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#### **Modeling Study**

	T
Forecast Models Used in ICARTT-2K4 Ensemble	Provided By
Multiscale Air Quality Simulation Platform – Real-Time	Baron Advanced Meteorological
(MAQSIP-RT 45km)	Systems
Multiscale Air Quality Simulation Platform – Real-Time	Baron Advanced Meteorological
(MAQSIP-RT 15km)	Systems
Eta-Community Model for Air Quality (Eta-CMAQ 12km)	NOAA/NWS National Centers
	for Environmental Prediction
Weather Research and Forecast Model – Chemistry (WRF-Chem	NOAA Forecast Systems
27km)	Laboratory
Canadian Hemispheric and Regional Ozone and NOx System	Canadian Meteorological
(CHRONOS 21km)	Service
A Unified Regional Air-Quality Modeling System (AURAMS	Canadian Meteorological
42km)	Service
Sulfur Transport and Emission Model 2003 (STEM – 2K3 12km)	University of Iowa
	-



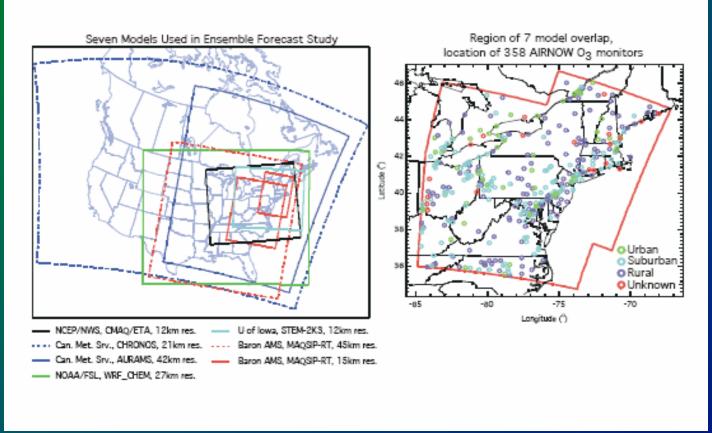


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The 56 day period between 00Z 7/6/04 and 00Z 8/30/04 is the sampling period used in this analysis.

#### Figure 1







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#### MAQSIP-RT Results in Context of Seven Member Ensemble

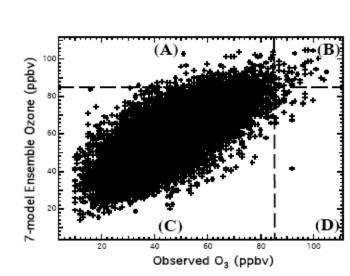
$$\mathbf{r(i)} = \frac{\sum_{\text{days}} \left(O_3^{\text{modi}}(i, day) - O_3^{\text{modi}}(i, avg)\right) \left(O_3^{\text{abs}}(i, day) - O_3^{\text{abs}}(i, avg)\right)}{\sqrt{\sum_{\text{days}} \left(O_3^{\text{modi}}(i, day) - O_3^{\text{modi}}(i, avg)\right)^2 \sum_{\text{days}} \left(O_2^{\text{abs}}(i, day) - O_3^{\text{obs}}(i, avg)\right)^2}}$$
(1)

the mean bias;

Mean Bias(i) = 
$$\left(\frac{1}{N_{days}}\right) \sum_{days} \left[O_3^{model}(i,day) - O_3^{obs}(i,day)\right]$$
 (2),

and the root mean square error;

$$RMSE(i) = \sqrt{\left(\frac{1}{N_{days}}\right) \sum_{days} \left(O_3^{model}(i, day) - O_3^{obs}(i, day)\right)^2}$$
(3),



Probability of Detection:  $\frac{B}{B+D}$ 

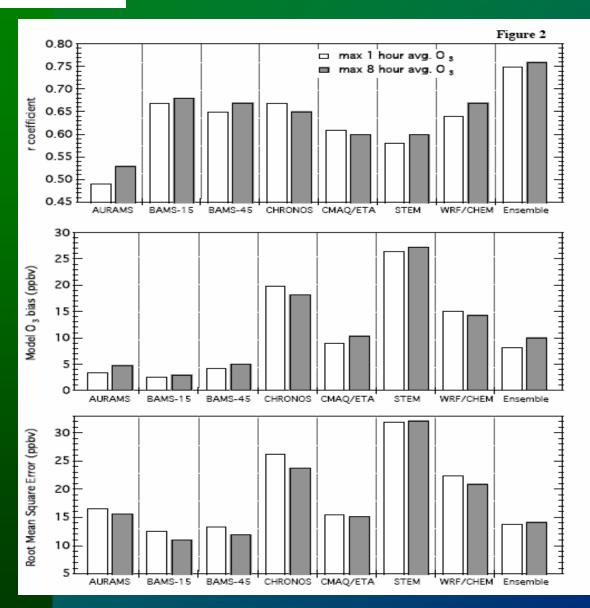
False Alarm Rate:  $\frac{A}{B+A}$ 

Critical Success Index:  $\frac{B}{B+A+D}$ 

Bias Ratio:  $\frac{A+B}{B+B}$ 







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# MAQSIP-RT Results in Context of Seven Member Ensemble

median average ricceff. 0.67 0.63 Bias 4.57 5.10 RMSE 11.74 12.40

Categorical Evaluation Accuracy (第) 99.06 Prob. of Detection (第) 21.52 False Alarm Rate (第) 79.01 Crit. Success Index (第) 11.89 Bias (ratio) 1.03

Peak 8-hr stats





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#### MAQSIP-RT Results in Context of Seven Member Ensemble

#### BAMS 45km

#### WRF-C 27km

#### Eta-CMAQ 12km CHRONOS 21km

Comparison Statistics for BAMS (45km) with ALRNOY doily B-hr max 0<sub>5</sub> 7/6/04 through 8/25/04

median average ricoeff. 0.67 0.63 Bias 4.57 5.10 RMSF 11.74 12.40

Categorical Evaluation Accuracy (紫) 99.06 Prob. of Detection (紫) 21.52 False Alar m Rate (紫) 79.01 Crit. Success Index (紫) 11.89 Biao (ratio) 1.03 Comparison Statistics for WRF-1 (27km) with AIRNOW daily 8-hr max 0<sub>5</sub> 7/6/04 through 8/25/04

median sverage r coeff. 0.68 0.65 Bias 14.07 13.79 RMSE 20.75 20.88

Categorical Evaluation Accuracy (家) 84.41 Prob. of Detection (家) 86.08 False Alanm Rate (家) 96.84 Crit. Success Index (家) 3.14 Bias (ratio) 27.25 Comparison Statistics for CMAQZETA (12km) With ALRNOW doily B-hr mex 0<sub>5</sub> 7/6/04 through 8/25/04

median average ricceff. 0.58 0.56 Bias 9.95 9.76 RMSE 1.4.87 15.31

Categorical Evaluation Accuracy (第) 98.53 Prob. of Detection (第) 49.37 False Alarm Rate (第) 62.51 Crit. Success Index (第) 14.85 Bias (ratio) 2.82 Companison Statistics for CHRONOS (21km) with AIRNOW doily 8-hr max 0<sub>3</sub> 7/6/04 through 8/25/04

Categorical Evaluation Accuracy (秀) 81.50 Prob. of Detection (秀) 75.95 False Alarm Rate (蜀) 97.63 Crit. Success Index (秀) 2.36 Bico (ratio) 32.00



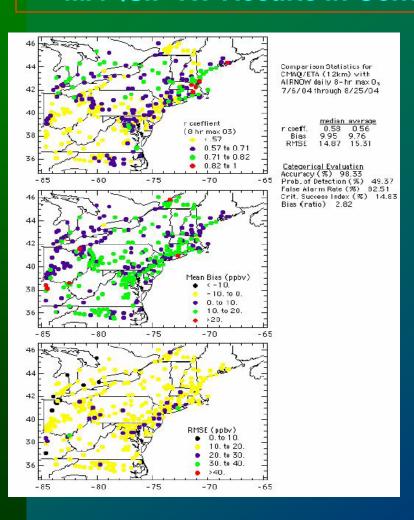


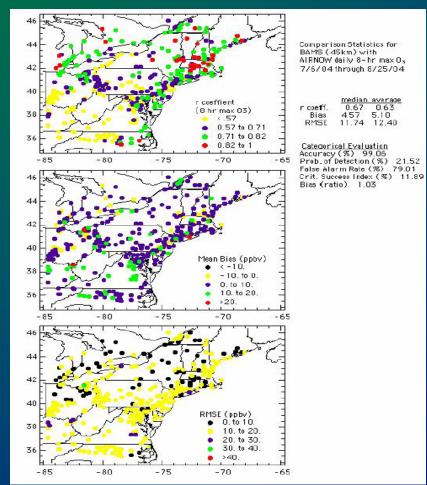
median average 0.67 0.63 4.57 5.10

11.74 12.40

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#### MAQSIP-RT Results in Context of Seven Member Ensemble

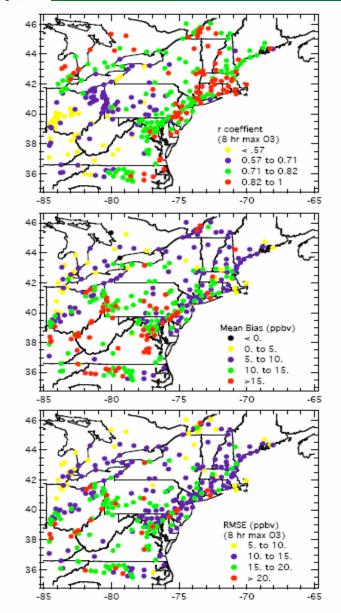








Figui



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MAQSIP-RT Results in Context of Seven Member Ensemble

> Seven Member Ensemble Result

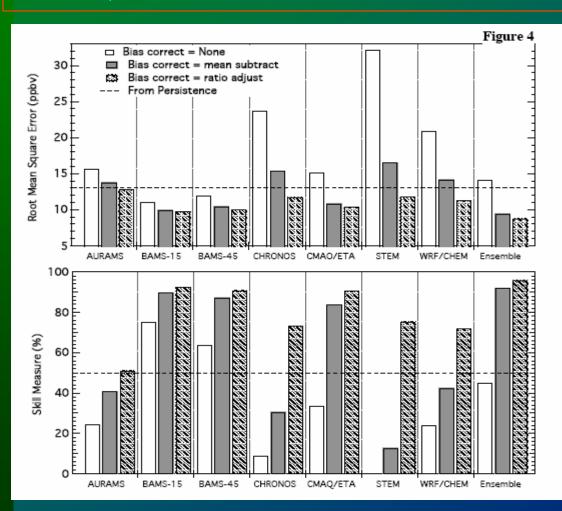




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Fraction of model-tomeasurement comparisons that have lower rmse scores when compared to persistence Is used as a measure of skill

Models having 50% or more points with lower rmse when compared with persistence are considered to have some skill

BIAS Correction improves skill in all cases: however, without bias correction, even the ensemble has poorer skill than the BAMS models

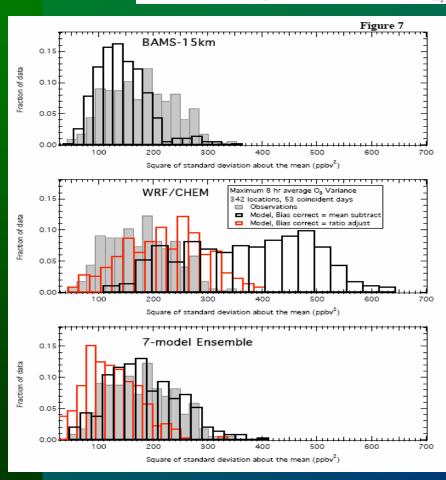


We define the variance at a given monitor to be the square of the standard deviation about the average O3:

Variance(i) = 
$$\left(\frac{1}{N_{days}}\right) \sum_{days} \left(O_3(i, day) - O_3(i, average)\right)^2$$
 (6),

where  $O_3$  can either be observed or model daily maximum average  $O_3$ . This quantity is chosen because it represents the power of the  $O_3$  signal about the mean from a purely signal processing point of view.

where i refers to O3 monitor i (i=1 to 342), Ndays refers to number of observing days at each site,



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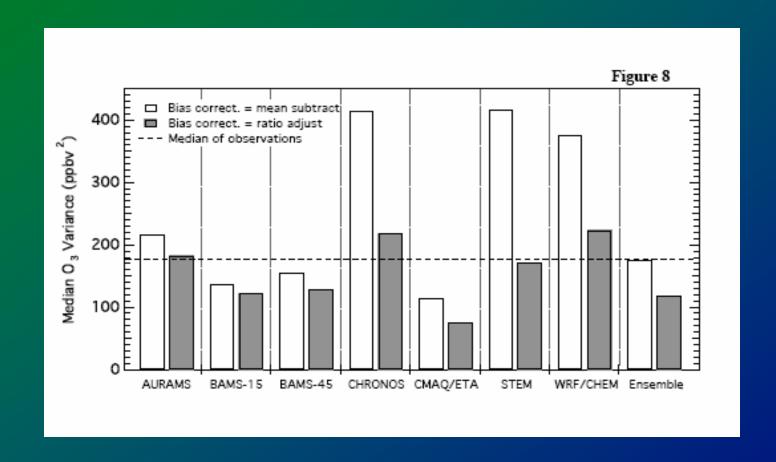




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#### MAQSIP-RT Results in Context of Seven Member Ensemble







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## Study Conclusions: Individual Models and Ensembles

Combined Error Statistic Comparison – No Bias Correction
CES = (RMSE + BIAS)/(Corr)

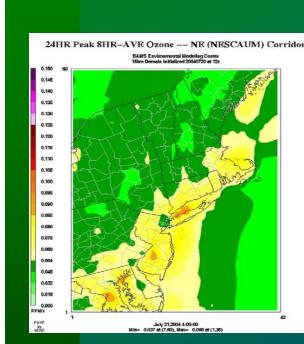
A score of 0 is "perfect"

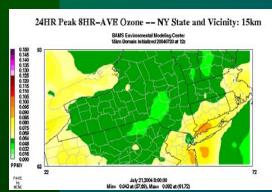
Forecast Models Used During ICARTT – 2K4	Combined Error Statistic
Multiscale Air Quality Simulation Platform – Real-Time (MAQSIP-RT 45km)	22.15
Multiscale Air Quality Simulation Platform – Real-Time (MAQSIP-RT 15km)	27.77
NOAA-EPA (Eta-CMAQ Community Model for Air Quality 12km)	44.76
Weather Research and Forecast Model – Chemistry (WRF-Chem 27km)	53.33
Canadian Hemispheric and Regional Ozone and Nox System (CHRONOS 21km)	65.96
A Unified Regional Air-Quality Modeling Systems (AURAMS 42km)	44.70
Sulfur Transport and Emissions Model (STEM –2K3 12km)	108.92
Ensemble	34.92

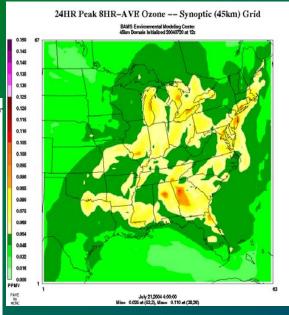
EPA National Air Quality Conference, San Francisco, February 14, 2005











Figures 1a, b, and c (top, middle, and bottom).

MAQSIP-RT 45km (top) and different 15km (middle and bottom) forecasts for peak 8-hr ozone valid July 21, 2004 issued 12z July 20, 2004.

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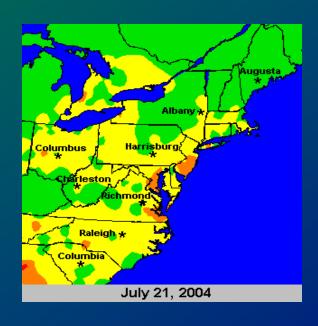


Figure 2. AIRNow gridded peak 8-hour ozone observations for July 21, 2004.

#### MAQSIP-RT Results in Context of Seven Member Ensemble







nternational Consortium for Atmospheric Research on Transport and Transformation

# Study Conclusions: Individual Models and Ensembles

- The BAMS MAQSIP-RT systems leads all models available in the US and Canada in forecast skill
- Ensembles of forecast models have promise to improve skill even further over single model forecasts





# Baron Advanced: Where are we Going?

We will be introducing CONUS forecasts not only for ozone but for PM 2.5 and HAZE this coming forecast season

We will be offering an ensemble air quality forecast product suite in the near future

We will continue to contribute to the national AQF effort through participation in field intensives and other R&D opportunities

STOP BY OUR BOOTH FOR MORE DETAILS!!!

And be sure to see Carlie Coats' poster with details of our Eta-CMAQ enabling technology





#### Reference and Contact Information

• McKeen, S., J. Wilczak, G. Grell, I. Djalalova, S. Peckham, E.-Y. Hsie, W. Gong, V. Bouchet, S. Menard, R. Moffet, J. McHenry, J. McQueen, Y. Tang, G.R. Carmichael, M. Pagowski, A. Chan, and T. Dye, 2005: Assessment of an ensemble of seven real-time ozone forecasts over Eastern North America during the summer of 2004. Submitted to Atmospheric Environment.

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